

# Lecture 14

Plan :

- 1) Global min cut
- 2) Min T-odd cut.
- 3) Next time: matroids.

↗ Mechthild Stoer

# Stoer-Wagner alg for global mincut.

Setup: • Let  $G = (V, E)$

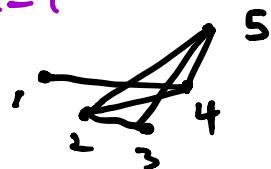
•  $u: E \rightarrow \mathbb{R}_{\geq 0}$

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## Algorithm idea:

- starting with vertex,  
build "max adjacency order",

e.g.  $u=1$

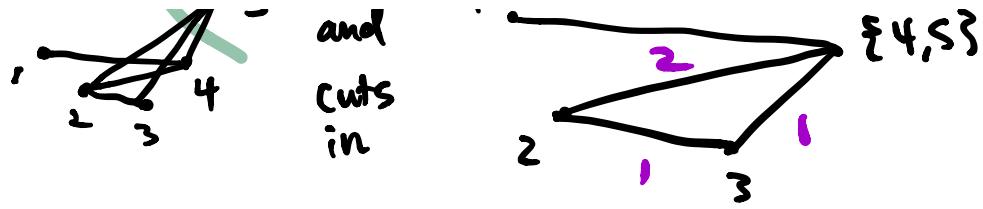


- Consider cut from last vertex,

e.g.

$u=1$





- Claim: best cut found this way is global mincut.
- 

Def: For  $A, B \subseteq V$ , define



Algorithm (Stoer - Wagner)

$\text{MINCUT}(G)$  # outputs cut.

▷ Let  $v_1$  any vertex of  $G$

▷  $n := |V(G)|$

# Create ordering

▷ initialize  $S = \emptyset$

▷ for  $i=2 \dots n$ :

$$\triangleright v_i = \arg \min_{v \in V \setminus S}$$



▷  $S \leftarrow S \cup \{v_i\}$

▷ if  $n=2$ :

▷ return

▷ else:

▷ Get  $G'$  by shrinking

# recursive call

▷ Let  $C =$

▷ return less costly of

Analysis: uses a claim.

Claim:

Claim  $\Rightarrow$  Correctness:

- The min cut is either a min  $V_{n-1} - V_n$  cut, or not.
- If it is, claim  $\Rightarrow$
- If not, induction  $\Rightarrow$

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Proof of Claim:

Let

be the ordering from alg.

- $A_i := \text{sequenz}$

$v_1, \dots, \dots v_{i-1}, v_i, \dots, v_{n-1}, v_n$

- Consider candidate  $v_{n-1}v_n$  cut, i.e.  $C \subseteq \sqrt{S}$  s.t.



- Want to show



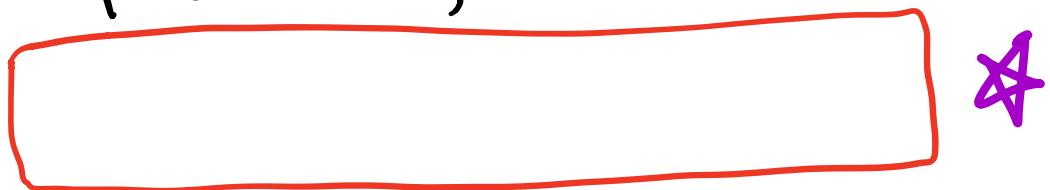
i.e.

- define  $v_i$  to be critical  
if

$v_1, v_2, \dots, \dots, \dots, v_n$

$c$

- Subclaim: Define  $C_i :=$   
if  $v_i$  critical, then



e.g.

$$\begin{array}{c} \text{e.g.} \\ \text{C} \end{array} \quad \leq \quad \begin{array}{c} C \\ A_i \\ v_i \end{array}$$

## Subclaim suffices:

because  $v_n$  is critical,

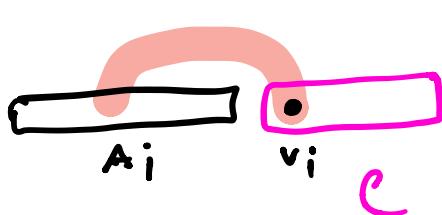
Subclaim  $\Rightarrow \underline{u(\delta(A_n))} \leq \underline{u(\delta(C))}$

$u(A_n : v_n)$      $u(C_n : A_{n+1} \setminus v_n)$

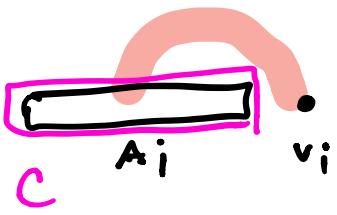
is  $\cancel{\neq}$  for  $i=n$ .

## Proof of Subclaim:

- induction on seq. of critical vertices.
- (base:)  $\cancel{\neq}$  true for first critical  $v_i$



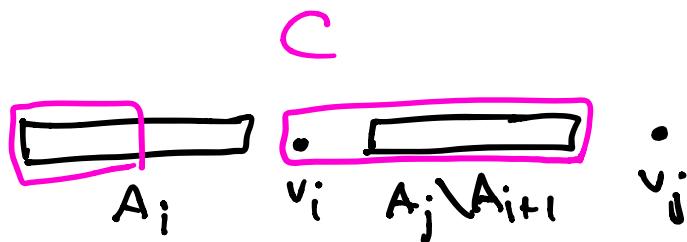
or



( )

- (inductive) Assume ~~not~~ true for critical  $v_i$ , let  $v_j$  nest critical.

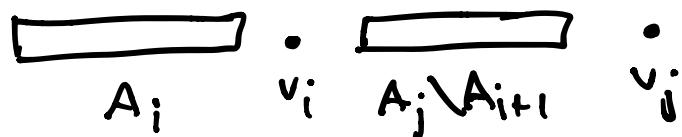
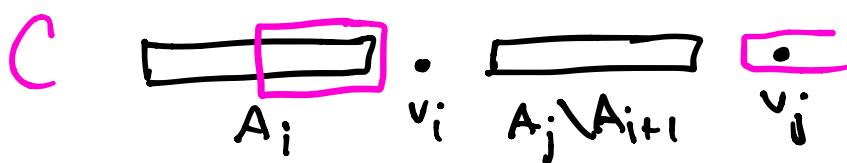
e.g.



- Assume  $v_i \in C$ ,  $v_j \notin C$ . (as in pic)

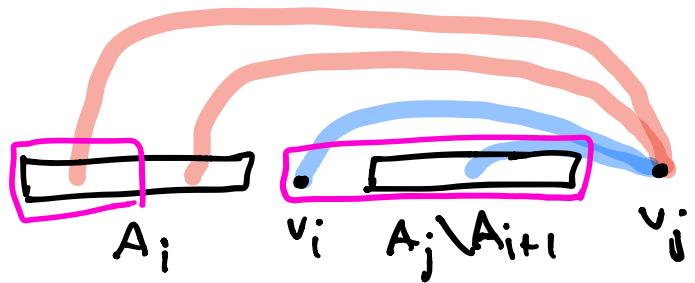
Is WLOG:

e.g.

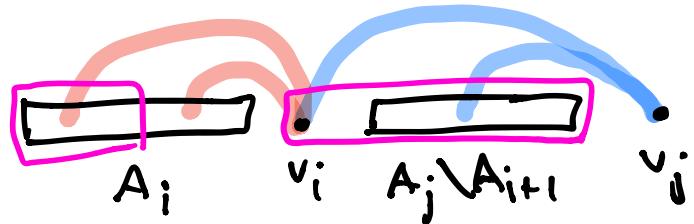


- Then

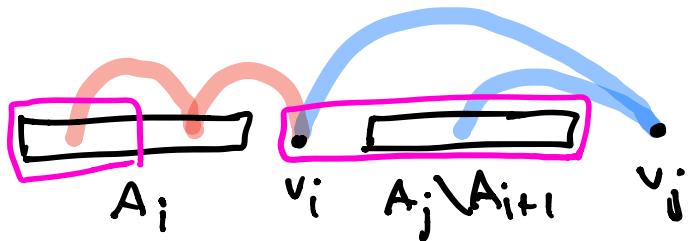
$$u(A_j : \{v_j\}) =$$



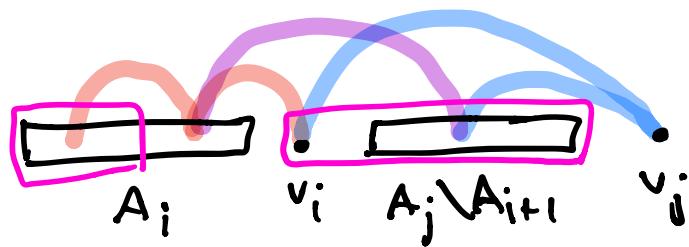
$\leq$



$\leq$



$\leq$



□

## Running time:

Depends how you implement ordering.

- While building ordering, must maintain list of costs

- must quickly find minimum & update new after picking  $v_{i+1}$ .
- This is what "priority queues" are for, e.g. "Fibonacci heap".
- with Fibonacci heap, can build ordering in time.
- total runtime
- Compare to from computing maxflows.

## Submodularity

- Stoer-Wagner can be extended to minimize a more general class of functions than  $S \mapsto u(\delta(S))$ .

- function  $f: 2^V \rightarrow \mathbb{R}$  submodular  
 if  $\boxed{\quad} \geq \boxed{\quad}$ .

- Examples:
  - ▷  $f(S) = \dots$ ,
  - ▷  $f(S) = \dots$  for  
u nonnegative, even if G  
directed.
  - ▷  $V = \text{food items on menu}, S \subseteq V$  meal

Submodularity equivalent to  
"diminishing marginal returns":

For  $S \supseteq T$ ,  $v \notin S$ ,

symmetric ( )

- Stoer-Wagner algorithm can be extended to minimize any submodular function.

↳ Queyranne '95. ( ).

Application of submodularity:

# Minimum T-odd cut

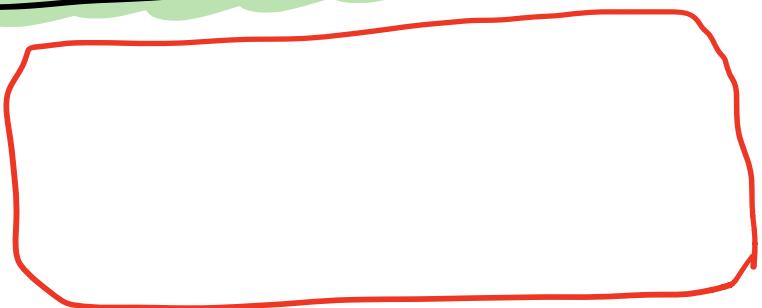
- $G = (V, E)$

$$u: E \rightarrow \mathbb{R}$$

$$T \subseteq V$$

- minimum T-odd cut problem:

$S =$



- Say  $S$  is T-odd if .

- Note:

- why do we care?

Recall

THM (Edmonds) Let

$$X = \{ \mathbf{x}_m : m \text{ matching in } G \}.$$

Then  $\text{conv}(x) = P$  where

$$P = \{ \mathbf{x} : \forall v \in V.$$

$$\forall S \subseteq V$$

$$|S| \text{ odd}$$

$$\forall e \in \bar{E}. \}$$

- How can we quickly test if

$$\mathbf{x} \in P ?$$

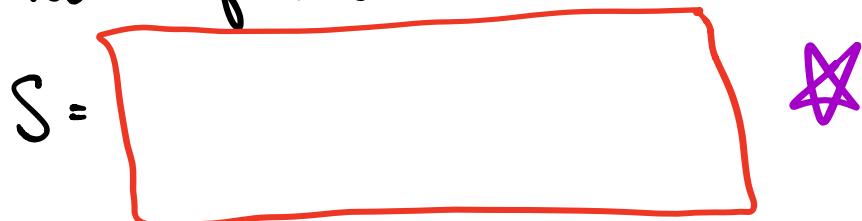
- Padberg-Rao: Can express as min odd cut problem.

► what's more, can get separating hyperplane if  $x \notin P$ .

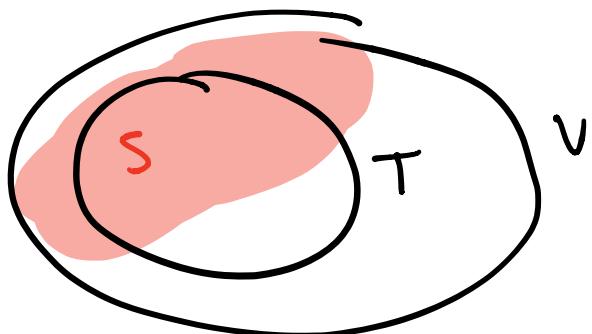
- This can be used to optimize over  $P$  via ellipsoid alg, despite there being no polynomially size LP for optimizing over  $P$  (Rothvoß).
- Today:
  - poly. time alg. for min T-odd cut
  - crucially uses submodularity.

# Algorithm $\text{ALG}(G, T)$

- 1) Find min cut among those with one vertex of  $T$  on each side:



- Takes  $|T| - 1$  min s-t cut computations:

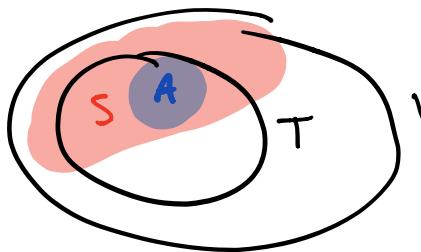


- 2) clf  $S$  is  $T$ -odd cut, is minimum;  
return  $S$ .

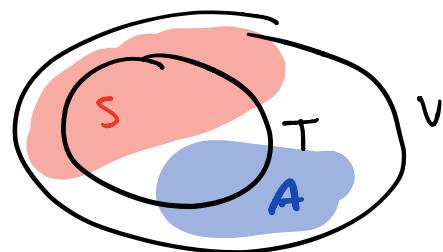
Else: If  $S \cap T$  even, use

Lemma: If  $S$  as in ~~\*~~,  $|S \cap T|$  even,

e.g.



OR



Pf: after alg.

- Lemma  $\Rightarrow$  2 recursive calls suffice:

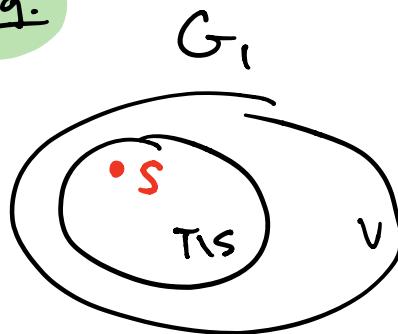
$\triangleright G_1 :=$

$T_1 :=$

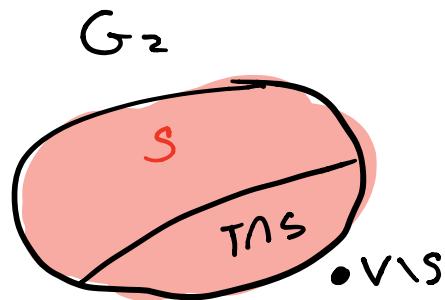
$\triangleright G_2 :=$

$T_2 :=$

e.g.



or



Return:

$\min$

Running time why poly time if  
2 recursive calls?

$R(k) :=$

Then

a)  $R(z) = T :=$

b)  $R(k) \leq \max$   
 $k_1 \geq 2$   
 $k_2 \geq 2$   
 $k_1 + k_2 = k$

By induction,  $R(k) \leq$

PF: • base: True for  $k=2$

• Inductive:

$$R(k) \leq \max$$
$$k_1 \geq 2$$
$$k_2 \geq 2$$
$$k_1 + k_2 = k$$

$\leq$

$=$

$\leq$

Thus: algorithm is polynomial.

- Now for the lemma.
- Proof uses submodularity.

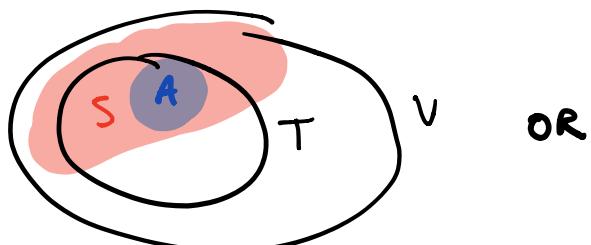
Recall:

**Lemma:** Let  $S$  min cut subject  
to  $\emptyset \neq S \cap T \neq T$ ,  $|S \cap T|$  even, then

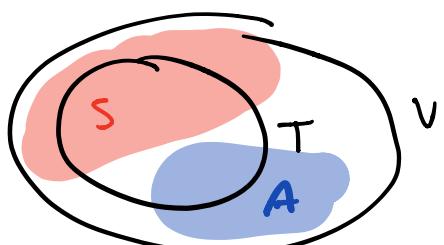
$\exists$  min  $T$ -odd cut  $A$  with

$$A \subseteq S$$

or  $A \subseteq V \setminus S$ .

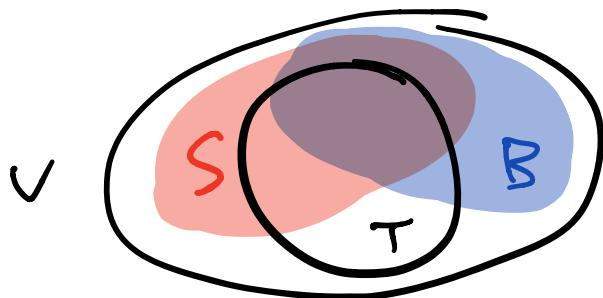


OR



## Proof

- Let  $B$  be any minimum  $T$ -odd cut.

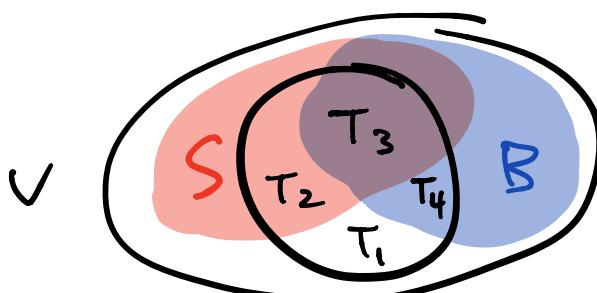


- We'll show we can take

- Make a partition.

$$T_1 = \quad , \quad T_2 =$$

$$T_3 = \quad , \quad T_4 =$$



- By definition of  $B, S$ , know all pairwise unions nonempty:

$$T_1 \cup T_4 = \emptyset$$

$$T_2 \cup T_3 \neq \emptyset$$

$$T_2 \cup T_1 \neq \emptyset$$

$$T_3 \cup T_4 \neq \emptyset$$

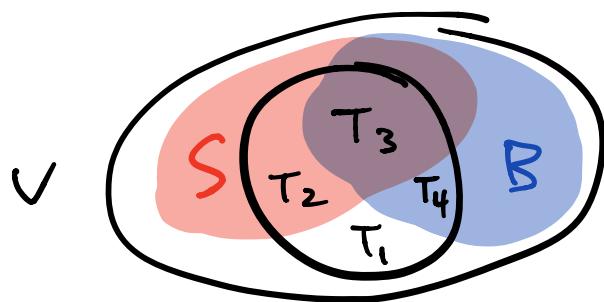


- By possibly replacing  $B \vdash V \wedge B$ , may assume

- Submodularity of cut  $\Rightarrow$

(Δ)

- As  $T_1 \neq \phi$ ,  $T_3 \neq \phi$ ,



- One of  $S \cup B$ ,  $S \cap B$  is T-even  
& the other T-odd because

## Summary:

- $\Delta \Rightarrow$  whichever of  $SUB$ ,  $S\cap B$  odd  
has cut value  $\leq$   
the other  $\leq$

$\Rightarrow$

□